

Midterm: Lecture, 19, 21, 26th

① Review 28th
Send midterm on 28th
th 28th - Wed 3rd

Midterm 1-2 class length
midterms

② 1/2 next week

③ Computations

Outline:

Before: Microcanonical & Canonical
ensembles, entropy & free energy

Currently: can't solve most problems,
computers solve, by statistical
sampling

Today MID

Next: approximate solutions
[gases & liquids]

Late: Phase transitions
Dynamics, Non Eq

Canonical Sampling $P(q, p) \propto e^{-\beta H(p, q)}$

But, MD gives microcanonical distribut.

First: Integration algorithm

$$\frac{dq}{dt} = \frac{\partial H}{\partial p} \quad \frac{dp}{dt} = -\frac{\partial H}{\partial q} \quad \checkmark \text{ force}$$

$$q(t + \Delta t) = q(t) + \Delta t \frac{dq}{dt}$$

small Δt
approx

$$p(t + \Delta t) = p(t) + \Delta t \frac{dp}{dt}$$

Verlet, Velocity verlet algorithms
Taylor expansions of position

$$\textcircled{1} \quad q(t + \Delta t) = q(t) + \Delta t \underbrace{\frac{dq}{dt}}_{v(t)} \Big|_t + \frac{\Delta t^2}{2} \underbrace{\frac{d^2q}{dt^2}}_{a(t)} \Big|_t + \dots$$

$= F(t)/m$

$$q(t + \Delta t) = q(t) + \Delta t v(t) + \frac{\Delta t^2}{2} F(t)/m$$

$$\textcircled{2} \quad q(t - \Delta t) = q(t) - \Delta t v(t) + \frac{\Delta t^2}{2} F(t)/m \quad \leftarrow$$

add eqns

$$q(t + \Delta t) + q(t - \Delta t) = 2q(t) + \Delta t^2 F(t)/m$$

$$q(t + \Delta t) + q(t - \Delta t) = 2q(t) + \Delta t^2 F(t)/m \quad [\text{Verlet 1967}]$$

$$q(t + \Delta t) = 2q(t) - q(t - \Delta t) + \Delta t^2 \underbrace{F(t)}_m$$

store $q, q(t - \Delta t)$

calculate force every time

[Bruce Berne, Rahman lecture]

$$v(t) = \frac{q(t + \Delta t) - q(t - \Delta t)}{2\Delta t}$$

Get another scheme by, going back in time

$$q(t + \Delta t) \rightarrow q(t)$$

$$q(t) \approx q(t + \Delta t) - \Delta t v(t + \Delta t) + \frac{\Delta t^2}{2} \frac{F(t + \Delta t)}{m}$$

$$q(t + \Delta t) \approx q(t) + \Delta t v(t) + \frac{\Delta t^2}{2} \frac{F(t)}{m}$$

①. add one from other ↗

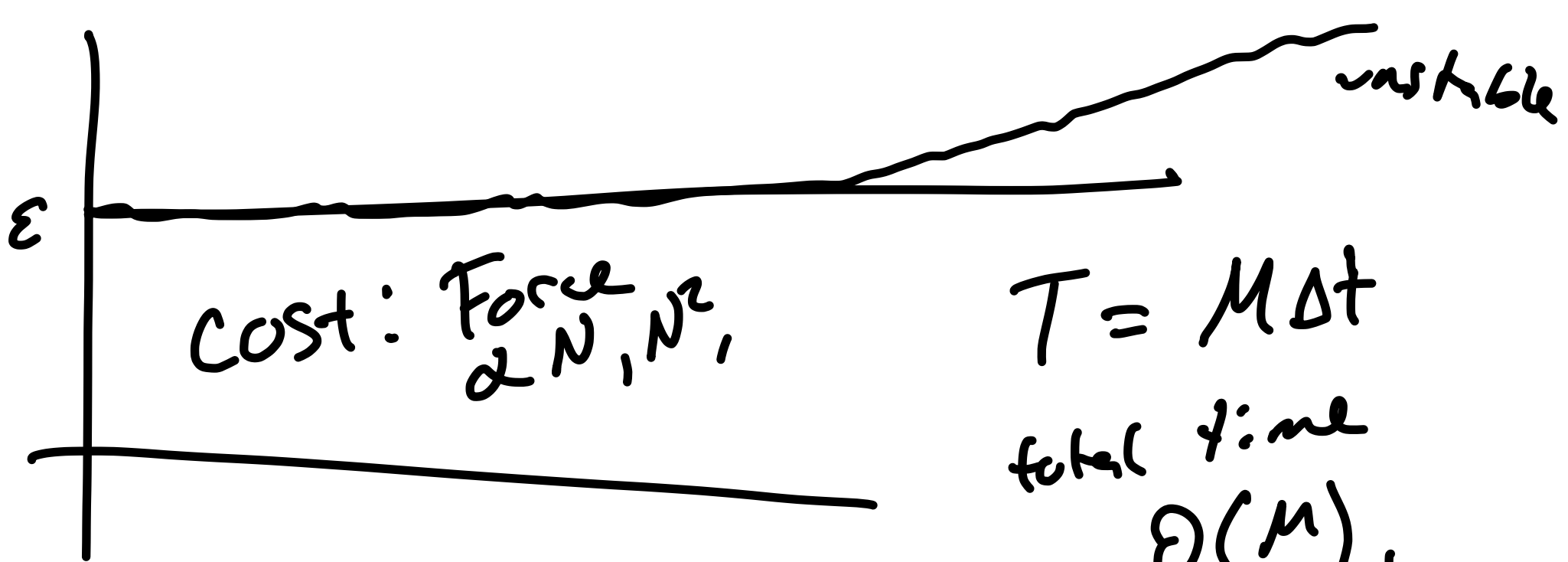
$$v(t + \Delta t) = v(t) + \frac{1}{2} \frac{\Delta t}{m} [F(t) + F(t + \Delta t)]$$

alternate 1 & 2

know: $q(0), v(0)$

store
 $q(t), p(t), F(t)$

[velocity verlet algorithm]



Cost: Force $\propto N, N^2$

$$T = M \Delta t$$

total time

$$\propto M \cdot N^d$$

stability $\propto \Delta t^n$

\downarrow
 $i \Delta t$

see further

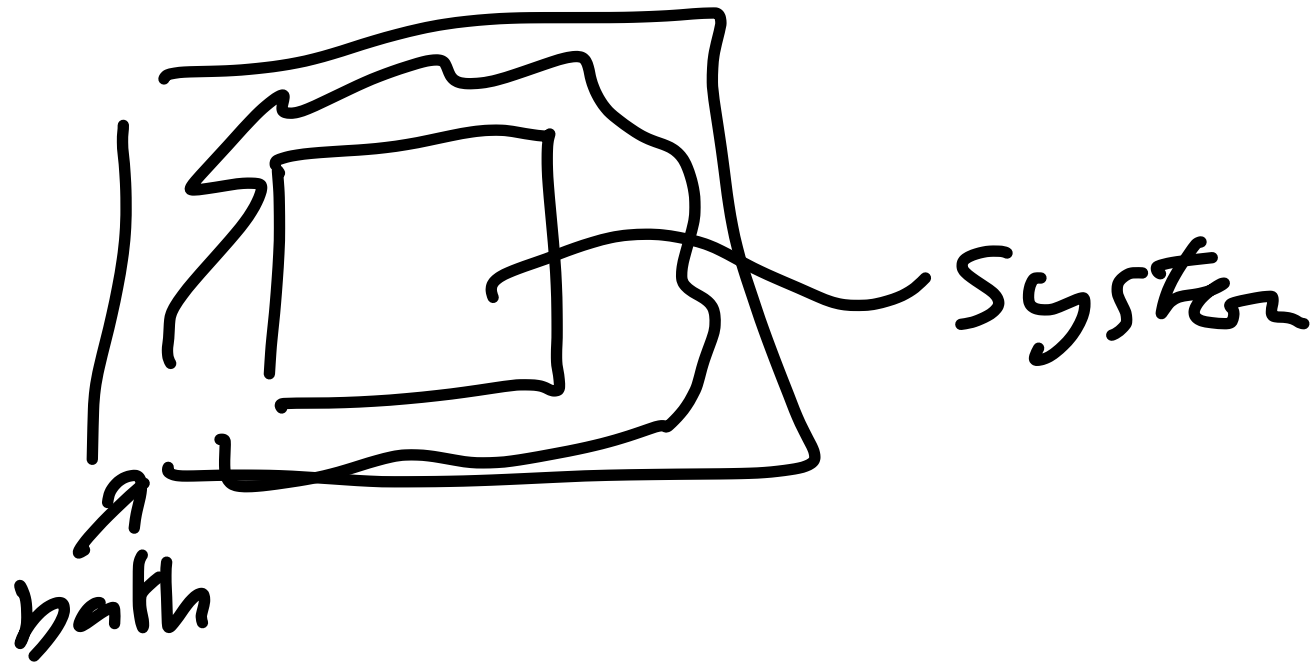
Formally $A(t) = e^{i \Delta t} A(0)$

$$A = \sum_p \xi_p$$

triple factorization \rightarrow
velocity verlet

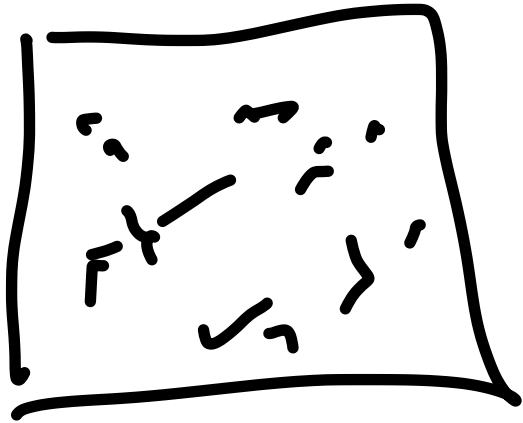
That was microcanonical

How do we get Canonical Sampling



3 early approaches - not accurate

① temperature rescaling



calculate temperature:

$$P(v) = e^{-\beta \frac{1}{2} m v^2}$$

$\sqrt{2\pi m k_B T}$

$$\langle v^2 \rangle = \frac{k_B T}{m}$$

$$\langle KE \rangle = \langle \frac{1}{2} m v^2 \rangle = \frac{k_B T}{2}$$

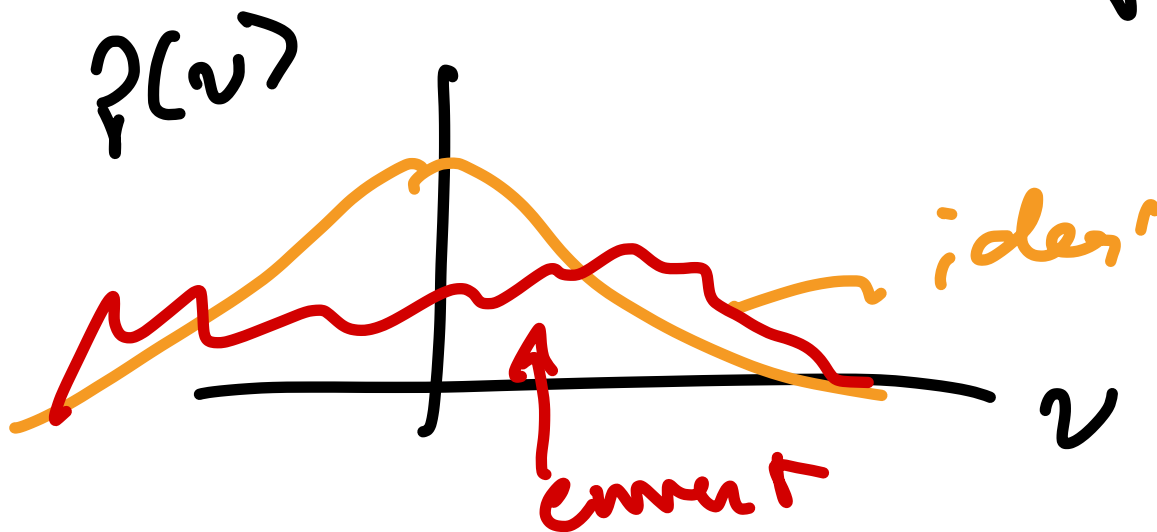
$$\left\langle \sum_{i=1}^{3N} \frac{1}{2} m_i v_i^2 \right\rangle = \frac{3}{2} N k_B T$$

$3N$ ← avg KE

$$k_B T_{\text{current}} = 2 \left\langle \frac{1}{3N} \sum_{i=1}^{3N} \frac{1}{2} m_i v_i^2 \right\rangle$$

$$\frac{k_B T_{\text{current}}}{k_B T_{\text{ideal}}} = \frac{m v^2(t)}{m v_{\text{ideal}}^2(t)}$$

$$v_{\text{ideal}} = v(t) \cdot \sqrt{\frac{T_{\text{ideal}}}{T_{\text{current}}}}$$



only fixes mean squared velo.
kind of preserves inertia

② Resampling

Reset all velocities from

$$p(v) = e^{-\beta \frac{1}{2} m v^2}$$

~~$\sqrt{\frac{2k_B T}{m}}$~~

Completely loses inertia

③ Andersen thermostat
randomly pick a particle with
(some)

rate ν , resample velocity

choose random number $r < \nu \Delta t$, resample

Better ideas:

① Langevin dynamics

[later, non eq]

adding random forces

② Extended ensemble

Nosé [1983, 84]

add an extra "fake particle"

keep track of KE, if too big

or small, velocities get rescaled

$$H_N = \sum_{i=1}^{dN} \frac{\tilde{p}_i^2}{2ms^2} + U(q) + \underbrace{\frac{p_s^2}{2Q}}_{\text{KE of } s} + \underbrace{gk_{\text{eff}} h(s)}_{U(s)}$$

$$p_i = \tilde{p}/s$$

Q "mass of s "
controls how fast
rescaling happens

EOM:

$dN+1$ positions & $dN+1$ momenta

$$\{q_i, \tilde{p}_i, s, p_s\} \leftarrow 2dN+2$$

$$H_N = \sum_{i=1}^N \frac{\tilde{p}_i^2}{2m_s^2} + U(q) + \underbrace{\frac{P_s^2}{2Q}} + \underbrace{gk_B T \ln(S)}$$

$$\dot{q}_i = \frac{\partial H}{\partial \tilde{p}_i} = \frac{\tilde{p}_i}{m_i s^2}$$

$$\dot{\tilde{p}}_i = -\frac{\partial H}{\partial q_i} = -\frac{\partial U}{\partial q_i} = F_i$$

$$\dot{s} = \frac{\partial H}{\partial P_s} = P_s / Q \quad \text{"velocity of s"}$$

$$\begin{aligned} \dot{P}_s &= -\frac{\partial H}{\partial s} = \sum \frac{\tilde{p}_i^2}{2m_s^3} - \frac{gk_B T}{s} \\ &= \frac{1}{s} \left[\sum \frac{\tilde{p}_i^2}{m_s^2} - gk_B T \right] \end{aligned}$$

g turns out be $(dN+1)$

$$\frac{dP_S}{dt} = \frac{1}{S} \left[\sum \tilde{v}_i^2 / m_s^2 - g k_B T \right]$$

$$= \frac{1}{S} \left[2K_E - (dN+1) k_B T \right]$$

$$\Omega(N, U, E) = \int d\mathbf{q}^{dN} \int d\mathbf{p}^{dN} \int d\mathbf{s} \int dP_S$$

[see Book]

$$\delta \left(\mathcal{H}(\tilde{\mathbf{p}}, \tilde{\mathbf{q}}) + \frac{P_S^2}{2\Omega} + g k_B T \ln S \right)$$

$$\propto e^{-\beta \mathcal{H}_{\text{can}}(\mathbf{p}, \mathbf{q})} \quad \text{if } g = dN+1$$